DATA FUSION/INTEGRATION OF HIGH AND MEDIUM RESOLUTION IMAGERY FOR CROP ANALYSIS

Iraq Operational Agricultural Monitoring Project:

United States Department of Agriculture (USDA)
Foreign Agricultural Service (FAS)
Office of Global Analysis (OGA)
International Production Assessment (IPA) Division





Presenter:

J. Edward Kunz, GISP

Geospatial Program Manager ASRC Management Services

Sean Griffin

Remote Sensing Crop Analyst Supporting USDA/FAS/OGA/IPAD



Photo by Dr. Curt Reynolds

Iraq Operational Agricultural Monitoring Project

Abstract:

When developing estimates of crop yield typically a convergence of evidence including weather patterns (rain and heat) ground truthing (actual observations) and remotely sensed data are used. There are numerous areas in the world wherein one or several of the aforementioned areas of evidence are not available.

The presentation will describe the satellite imagery used, detail processes and procedures utilized to fuse the data, explain how the data was analyzed and discuss the results obtained.



The International Production Assessment Division (IPAD) applies a "convergence of evidence" methodology to agricultural production assessments and forecasts. This all source methodology integrates both qualitative and quantitative datasets of various spatial and temporal scales in order to cross-validate the multiple sources and scrutinize forecast assumptions. Datasets are in the form of:

- Agro-meteorological time-series
- Land observation remote sensing
- Economic analysis reports
- Crop calendars
- News services
- Direct ground observations

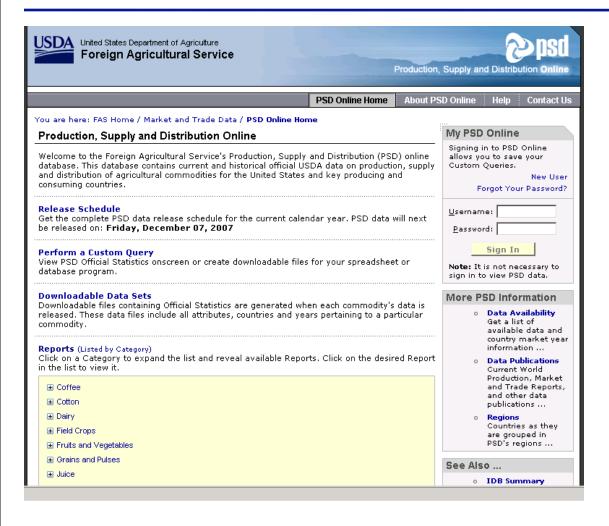
Production, Supply, and Distribution (PSD) Data

1) Cereal	Area, Yield and Production of Wheat												
		Erbil		Suleimanyah			Dohuk			All three Gov.			
Years	Cultivated	Yield	Production	Cultivated	Yield	Production	Cultivated	Yield	Production	Cultivated	Yield	Production	
	Area/ Ha.	Kg/Ha.	MT	Area/ Ha.	Kg/Ha.	MT	Area/ Ha.	Kg/Ha.	мт	Area / Ha.	Kg/Ha.	мт	
1987-1986	128133.8	800.0	102507.0	60056.8	1064.0	15975.1	53360.0	1612.0	21504.1	241550.5	1158.7	139986.2	
1988-1987	95245.3	808.0	76958.2	38498.5	1064.0	10240.6	48437.8	1568.0	18987.6	182181.5	1146.7	106186.4	
1989-1988	119107.3	380.0	45260.8	34247.5	812.0	6952.2	48186.0	1044.0	12576.5	201540.8	745.3	64789.5	
1990-1989	157902.5	880.0	138954.2	73412.8	1260.0	23125.0	64256.3	840.0	13493.8	295571.5	993.3	175573.0	
1991-1990	374677.5	560.0	209819.4	326617.0	552.0	45073.1	105064.8	1220.0	32044.7	806359.3	777.3	286937.3	
1992-1991	243369.8	600.0	146021.9	148812.5	600.0	22321.9	81367.3	940.0	19121.3	473549.5	713.3	187465.0	
1993-1992	189000.0	632.0	119448.0	198835.8	684.0	34000.9	174682.8	1400.0	61139.0	562518.5	905.3	214587.9	
1994-1993	184212.0	836.0	154001.2	210126.5	1168.0	61356.9	142325.0	1492.0	53087.2	536663.5	1165.3	268445.4	
1995-1994	200776.0	748.0	150180.4	220462.5	1320.0	72752.6	140232.5	1540.0	53989.5	561471.0	1202.7	276922.6	
1996-1995	164545.3	600.0	98727.2	164383.0	508.0	20876.6	126847.0	1028.0	32599.7	455775.3	712.0	152203.5	
1997-1996	106019.3	780.0	82695.0	141377.0	852.0	30113.3	115952.5	968.0	28060.5	363348.8	866.7	140868.8	
1998-1997	110593.5	1076.0	118998.6	132931.8	996.0	33100.0	83893.5	1244.0	26090.9	327418.8	1105.3	178189.5	
1999-1998	95217.8	396.0	37706.2	102546.0	468.0	11997.9	77862.5	348.0	6774.0	275626.3	404.0	56478.1	
2000-1999	79757.3	968.0	77205.0	130611.8	740.0	24163.2	79757.3	968.0	19301.3	290126.3	892.0	120669.4	
2001-2000	90548.8	1176.0	106485.3	129475.5	1084.0	35087.9	84978.0	1604.0	34076.2	305002.3	1288.0	175649.4	
2002-2001	132842.8	1364.0	181197.5	163325.0	1136.0	46384.3	121519.3	1588.0	48243.1	417687.0	1362.7	275825.0	
2003-2002	235015.0	1200.0	282018.0	109190.0	1400.0	38216.5	128937.5	1044.0	33652.7	473142.5	1214.7	353887.2	
2004-2003	98962.5	944.0	93420.6	70111.8	1428.0	25029.9	98310.0	1300.0	31950.8	267384.3	1224.0	150401.2	
2005-2004	116777.5	624.0	72869.2	153115.0	976.0	37360.1	102277.0	752.0	19228.1	372169.5	784.0	129457.3	
2006-2005	126888.0	1056.0	133993.7	120409.5	1088.0	32751.4	90814.5	1396.0	31694.3	338112.0	1180.0	198439.4	

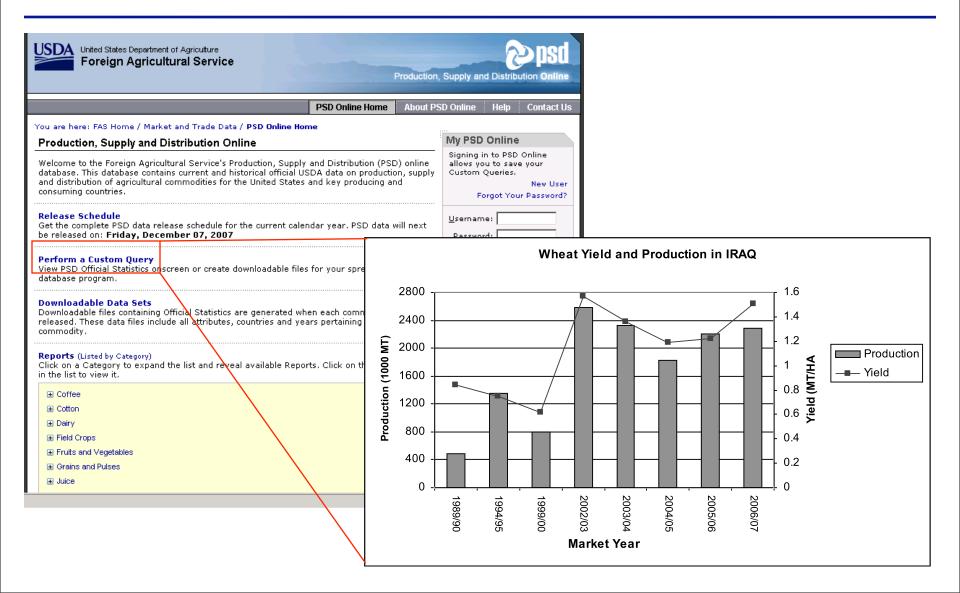
Production, Supply, and Distribution (PSD) Data

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1992-1991	243369.8	600.0	146021.9	3										
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2001-2000	90548.8	1176.0	106485.3	1.5		-	H	+	/	1		$-\parallel -\parallel -\parallel$		Area (MHa) Yield (MT/Ha)
2002-2001	132842.8	1364.0	181197.5						+ $1/1$					Prod (MMT)
2003-2002	235015.0	1200.0	282018.0			/								,
2004-2003	98962.5	944.0	93420.6	1 —		<u>/I</u> I	ННР				- - -			
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				0.5	**************************************	A, 3, 3, 3,	2765 8265 8	230g & 240g, &	Season	28,3, 29,10, 02	20, 0,0, 0,0,0	0304 0405 056	2805 O708	

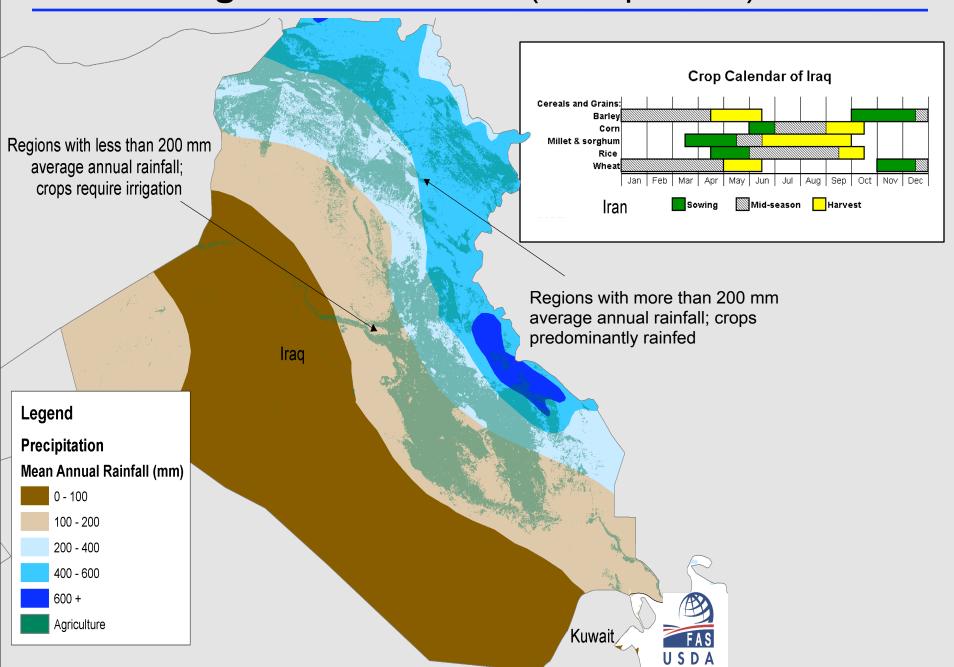
Production, Supply, and Distribution (PSD) Online



Production, Supply, and Distribution (PSD) Online

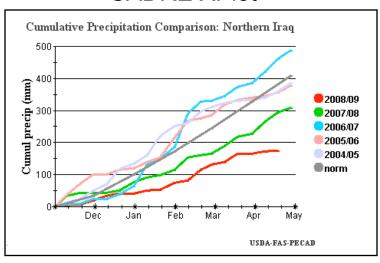


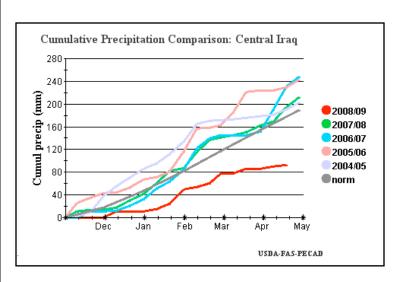
Agro-climatic Data (Precipitation)



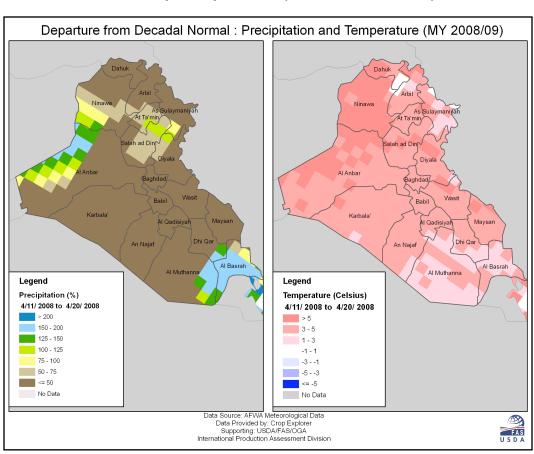
Agro-climatic Data (Precipitation & Temperature)

CADRE XPlot

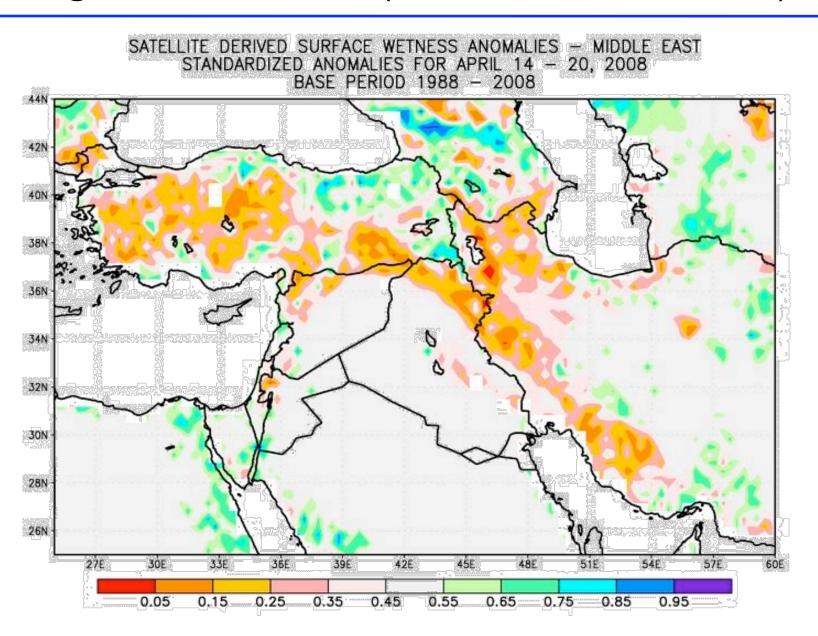




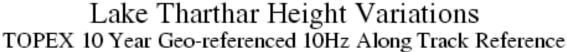
Crop Explorer (GIS Interface)

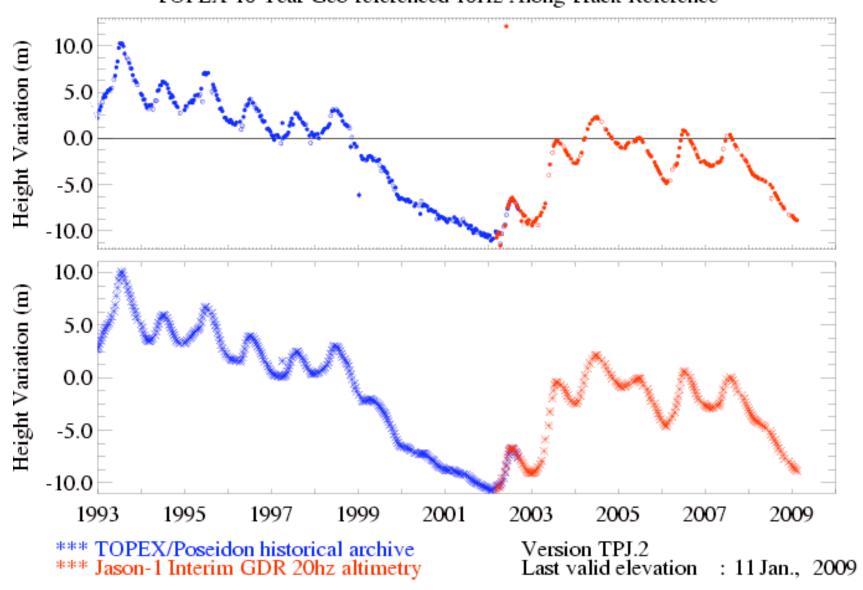


Agro-climatic Data (SSMI Surface Wetness)



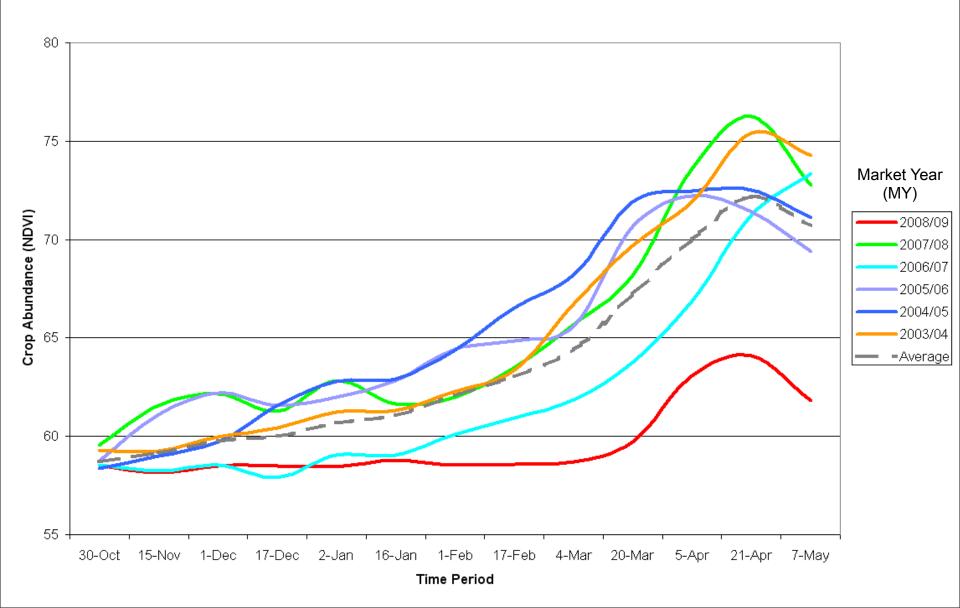
Hydrological Data (Reservoir Monitor)





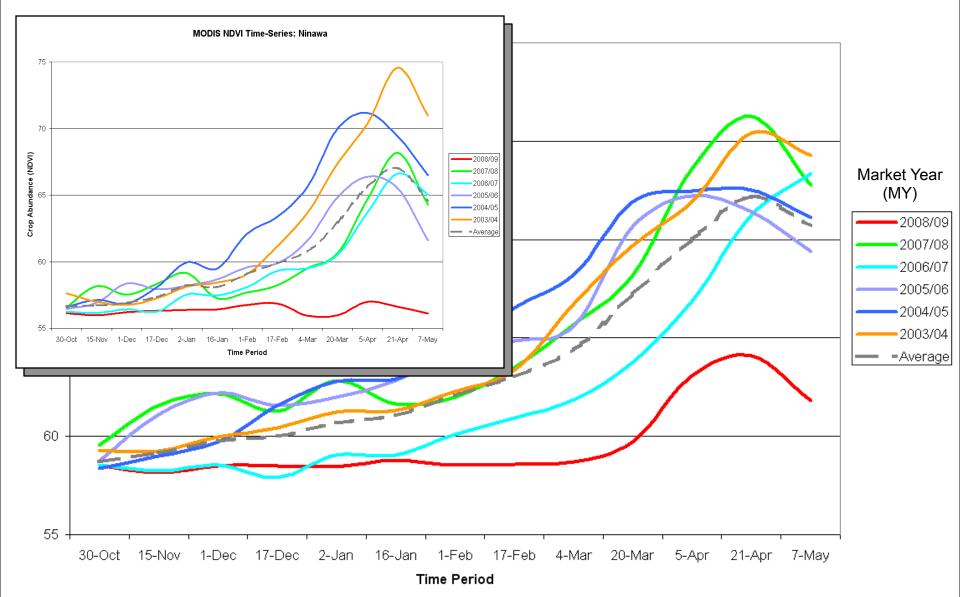
Agro-climatic Data MODIS Normalized Difference Vegetation Index (NDVI)





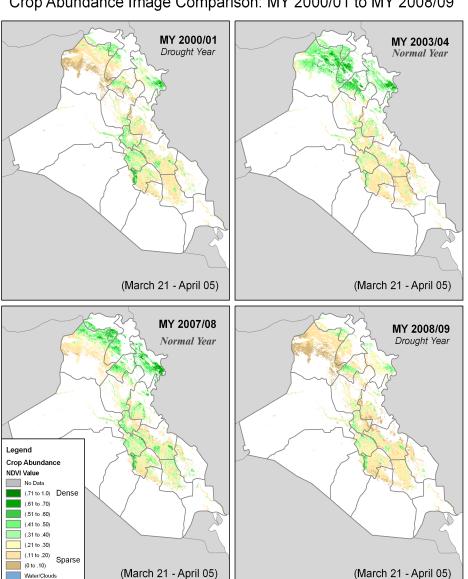
Agro-climatic Data MODIS Normalized Difference Vegetation Index (NDVI)





Agro-climatic Data (MODIS NDVI Time Series)





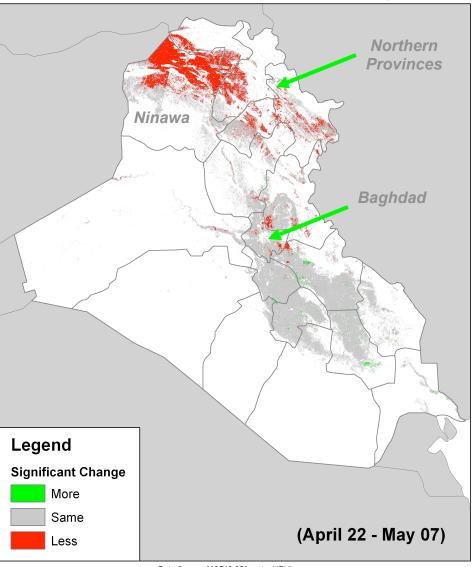
Data Source: MODIS 250-meter NDVI

Data Provided by: University of Maryland

Supporting: USDA/FAS/OGA

International Production Assessment Division

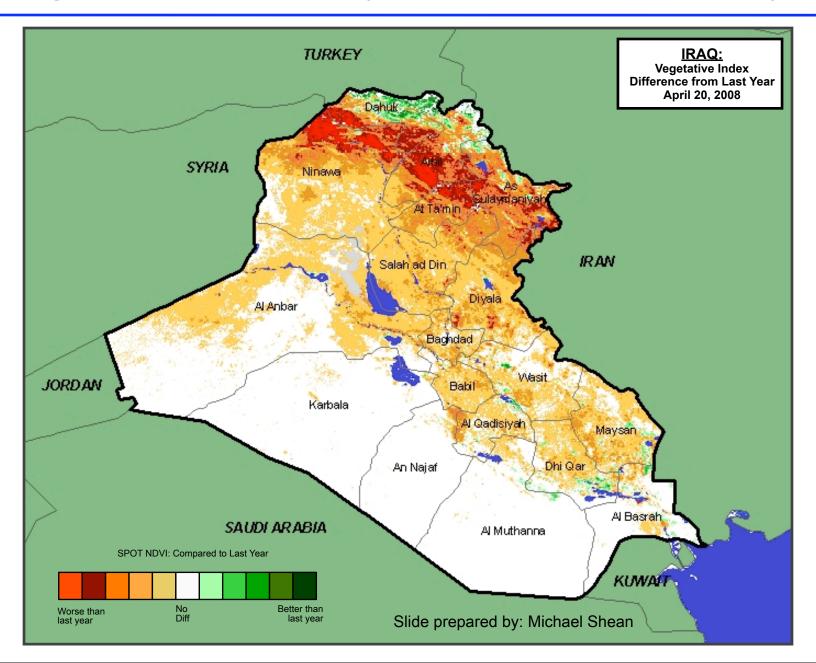
MODIS NDVI: Departure from 9-Year Average

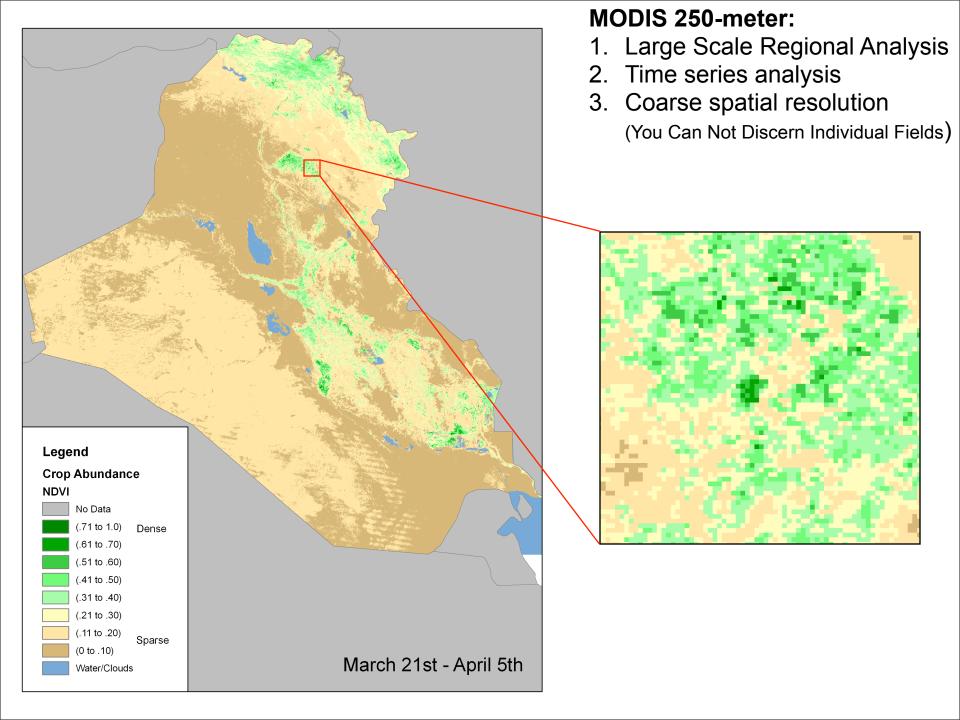


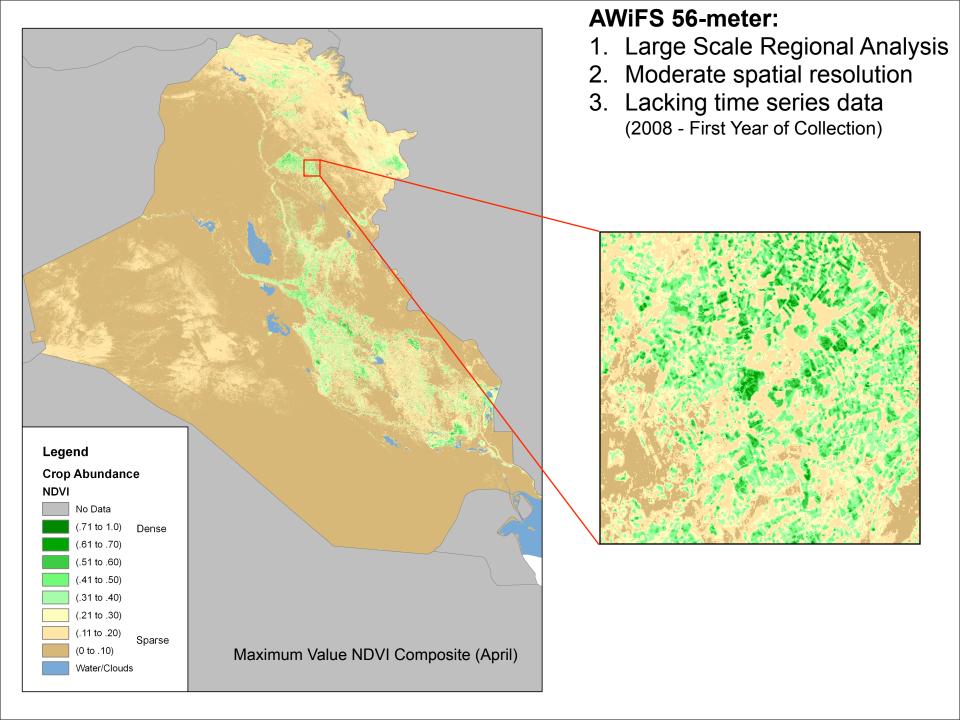
Data Source: MODIS 250-meter NDVI Data Provided by: University of Maryland Supporting: USDA/FAS/OGA International Production Assessment Division



Agro-climatic Data (SPOT VEG Time Series)





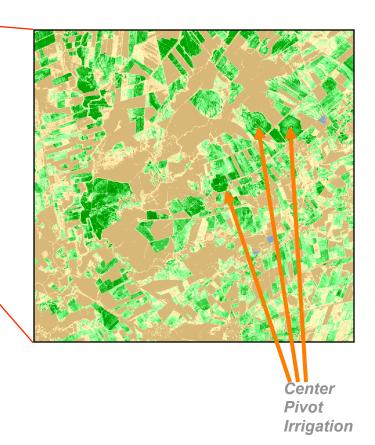


Dahuk Ninawa Às Sulaymaniyah At Ta'min Salah ad Din Diyala Al Anbar Baghdad Wasit Babil Karbala' Al Qadisiyah Maysan Dhi Qar An Najaf Al Basrah Al Muthanna Legend Quickbird AOI's Governorate

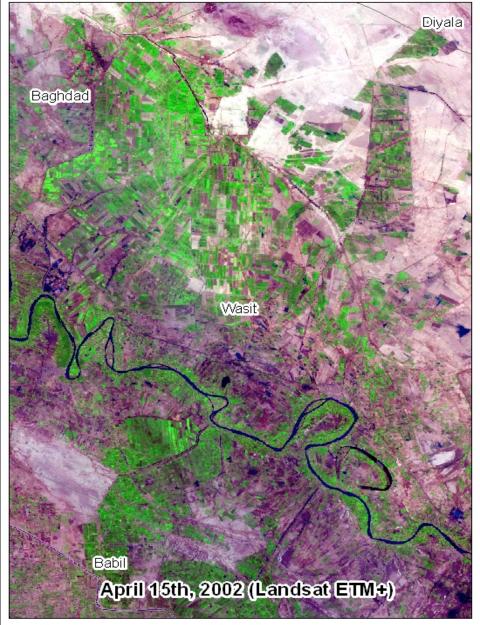
Image-based Ground Truthing

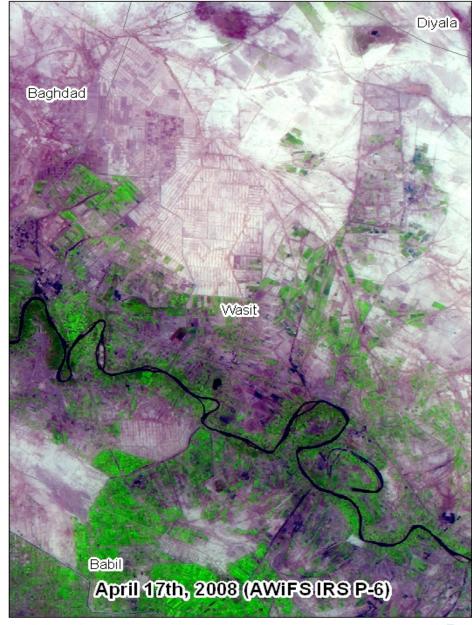
Digital Globe Quickbird

- 1. Support through NGA
- 2. Acquired over Northern Provinces
- 3. ~ 2.44 meter multispectral (Limited Coverage 13km Swath)



Multi-temporal Change Detection: Comparison of Current and Archived Data





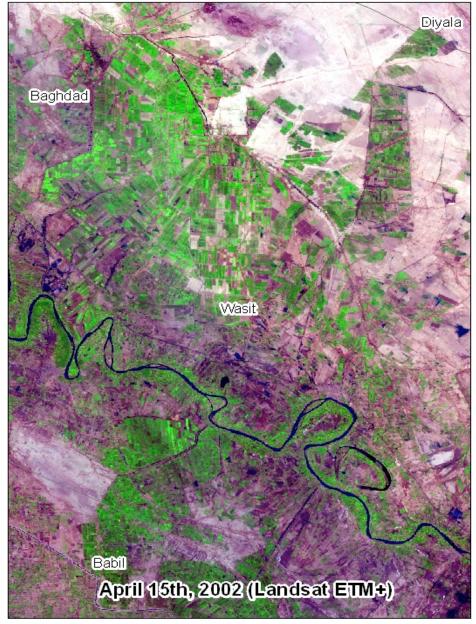
Spectral Bands 3,4 and 5

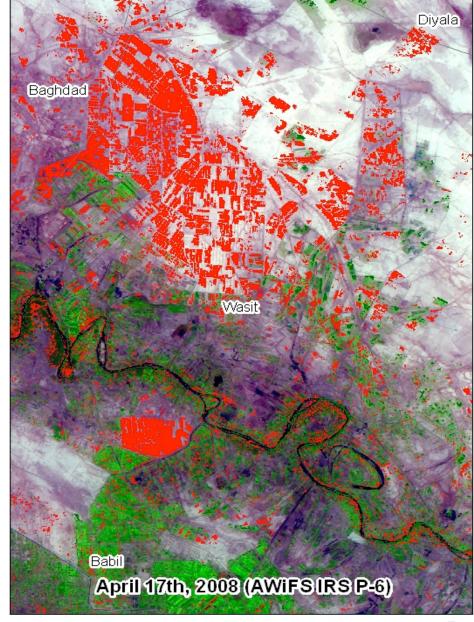
Data Source: Landsat ETM+/AWIFS IRS P-6
Data Provided by: Archive Explorer/NGA
Supporting: USDA/FAS/OGA
International Production Assessment Division

Spectral Bands 2, 3 and 4



Multi-temporal Change Detection: Comparison of Current and Archived Data





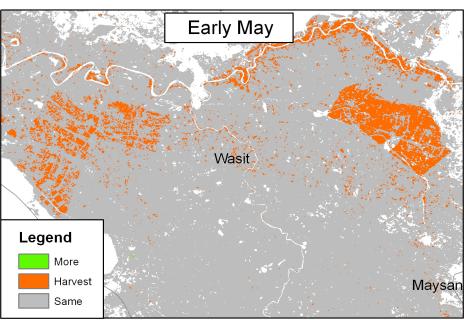
Spectral Bands 3,4 and 5

Data Source: Landsat ETM+/AWIFS IRS P-6
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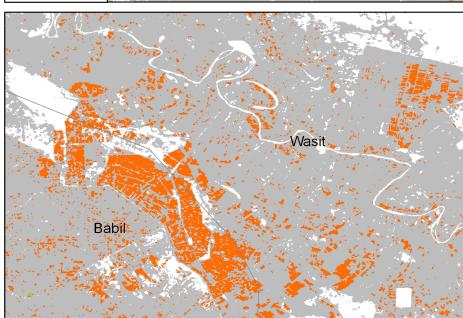
Spectral Bands 2, 3 and 4



Winter Grains Harvest Map: MY 2008/09





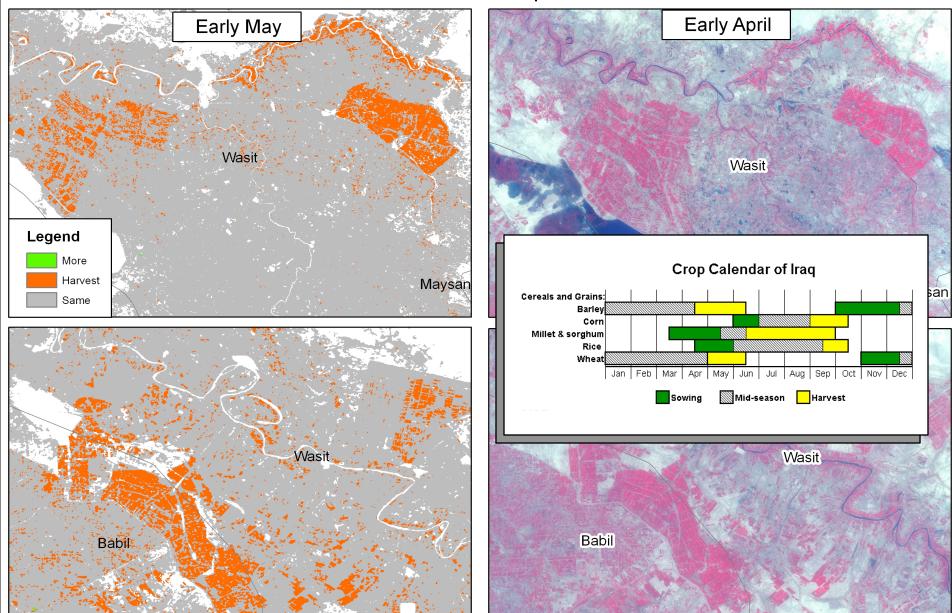








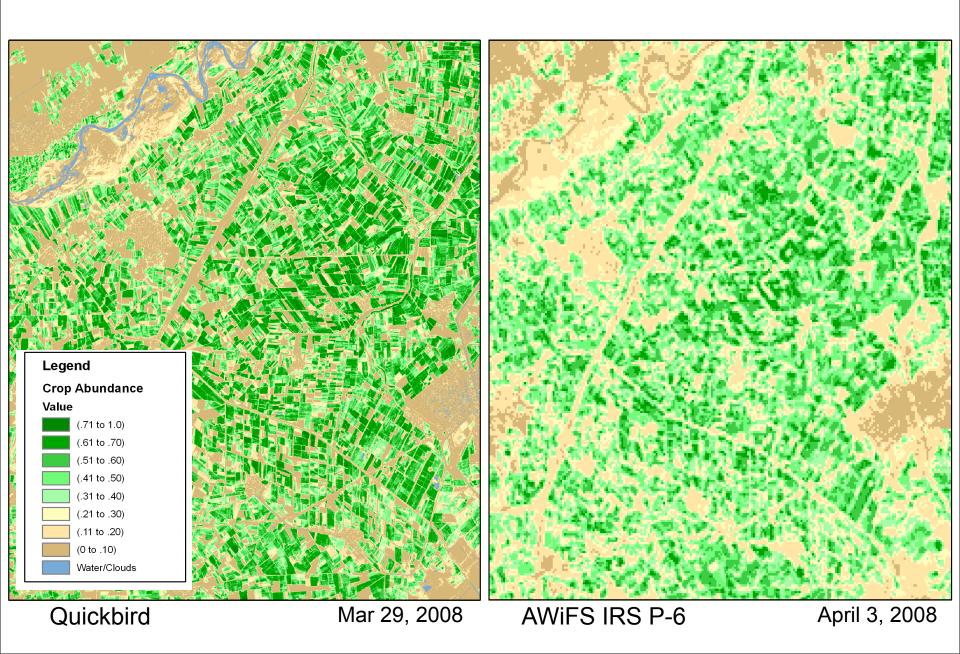
Winter Grains Harvest Map: MY 2008/09



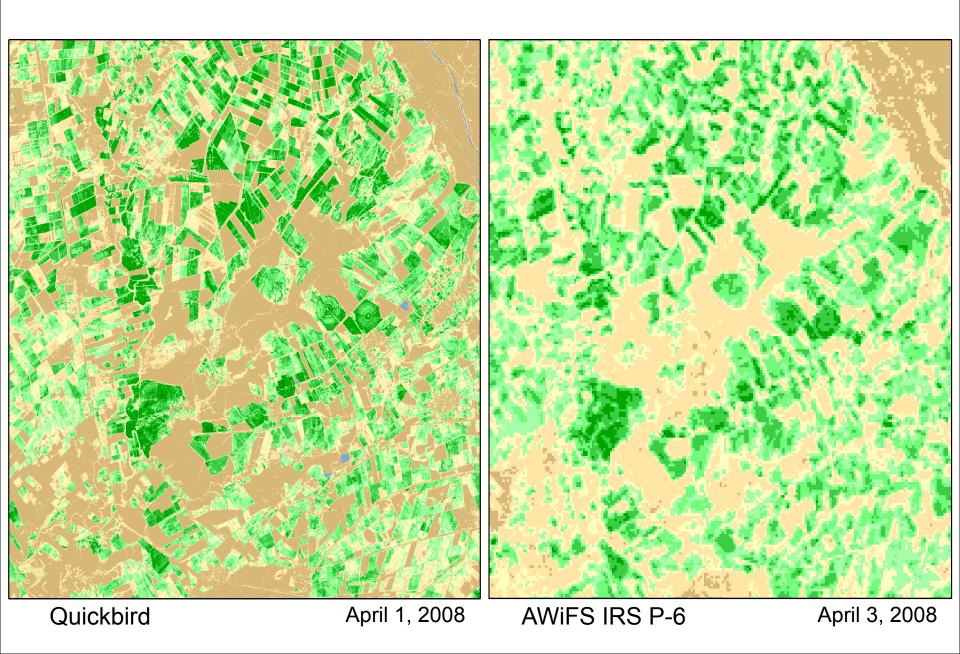




NDVI comparison: Quickbird & AWiFS IRS P-6



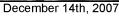
NDVI comparison: Quickbird & AWiFS IRS P-6



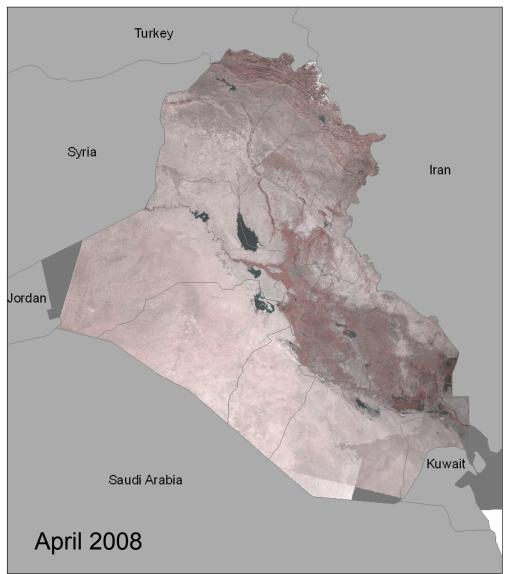
Multi-Temporal Change Analysis between October 26th, 2005 and December 14th, 2007







GDA Corp: SASR Mosaic

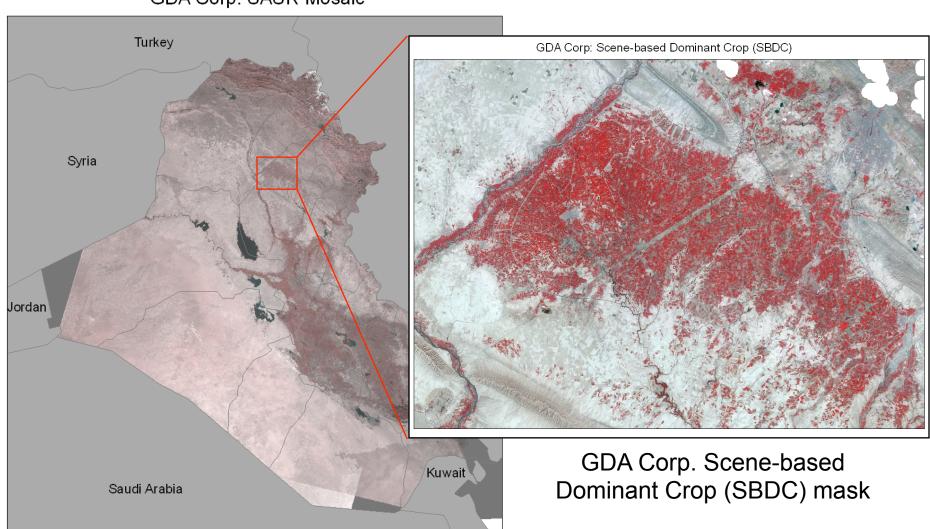


GDA Corp. Scene-based Dominant Crop (SBDC) mask





GDA Corp: SASR Mosaic

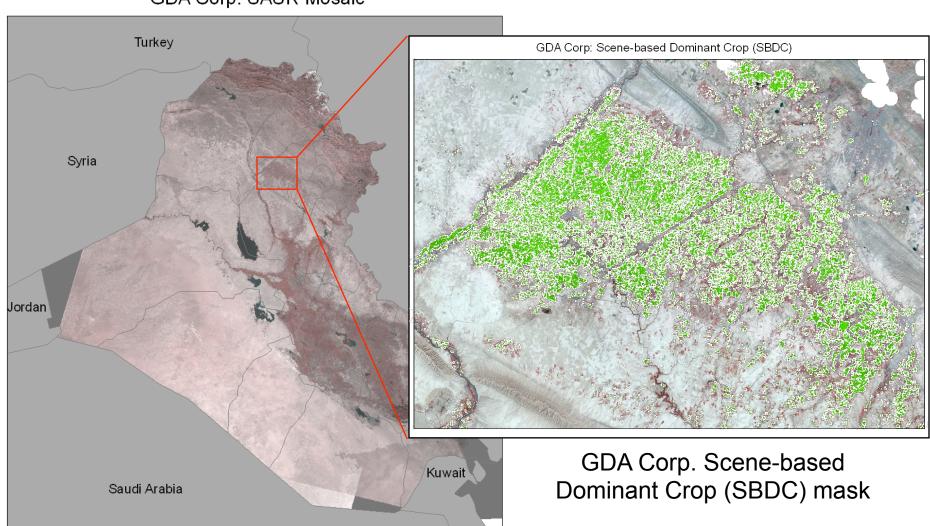


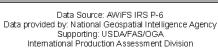


April 2008



GDA Corp: SASR Mosaic



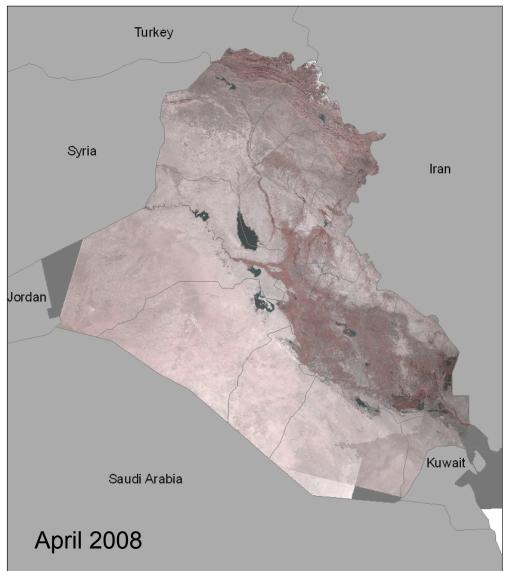






April 2008

GDA Corp: SASR Mosaic



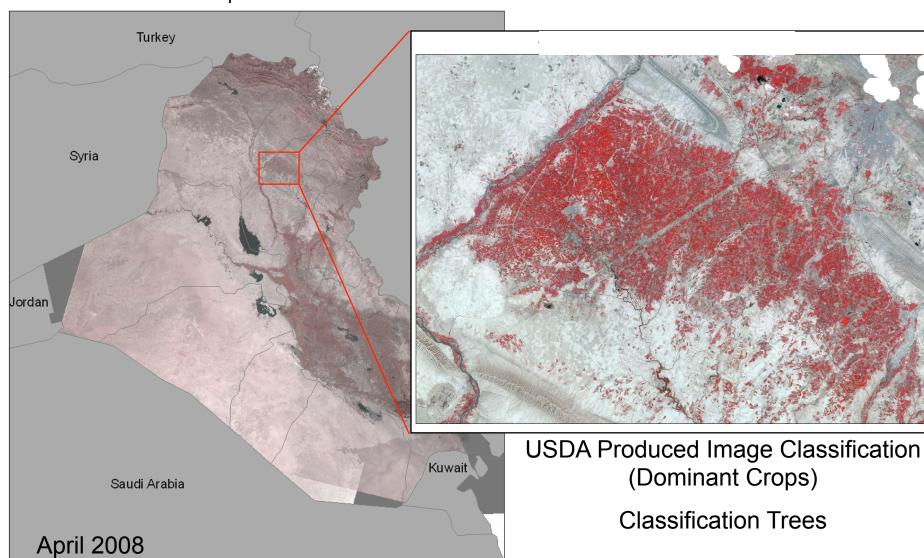
USDA Produced Image Classification (Dominant Crops)

Classification Trees





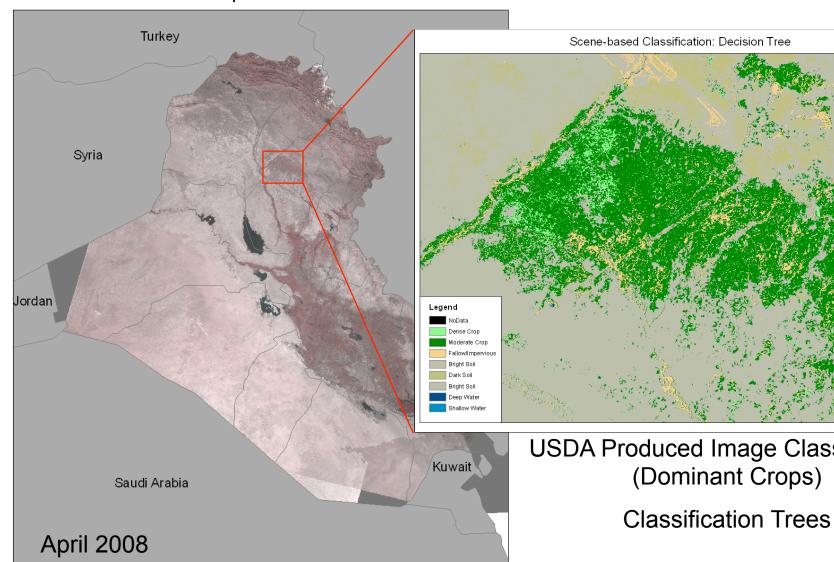
GDA Corp: SASR Mosaic







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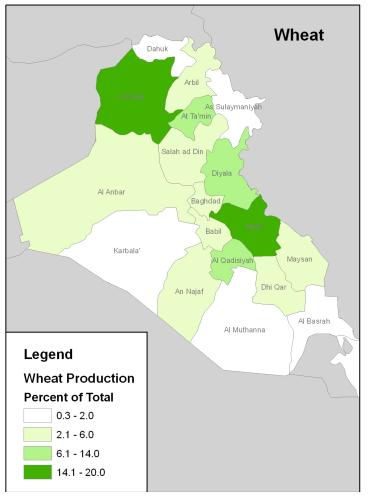








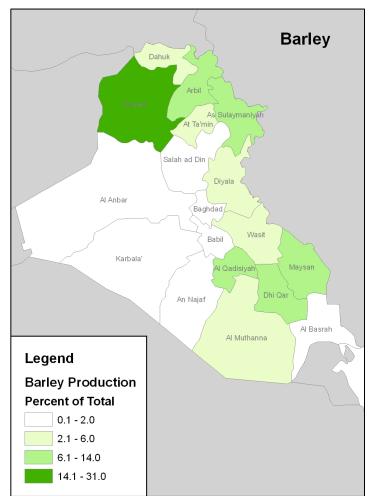
5-Year Average



Barle	y Area Fo	recast	: MY 20	008/09	(Million Hectares)					
Region	Governorate	2002/03	2003/04	2004/05	2005/06	2006/07	2007/08	2008/09	5-Year Average	Difference 5-Year Avg
North	Arbil	0.110	0.149	0.086	0.271	0.243	0.250	0.022	0.161	-86.5%
	Dahuk	0.032	0.039	0.027	0.037	0.041	0.050	0.009	0.034	-72.2%
	As Sulaymaniyah	0.122	0.043	0.052	0.125	0.108	0.110	0.051	0.087	-41.2%
	Ninawa	0.653	0.525	0.529	0.614	0.595	0.615	0.029	0.509	-94.2%
Central	At Ta'min	0.025	0.038	0.010	0.023	0.029	0.030	0.015	0.024	-38.4%
	Diyala	0.023	0.095	0.038	0.037	0.035	0.035	0.034	0.042	-19.5%
	Salah ad Din	0.016	0.030	0.039	0.028	0.015	0.015	0.020	0.023	-15.6%
	Baghdad	0.005	0.033	0.005	0.008	0.006	0.005	0.009	0.010	-9.1%
	Babil	0.012	0.017	0.021	0.020	0.024	0.025	0.020	0.020	2.1%
	Wasit	0.048	0.047	0.055	0.069	0.063	0.060	0.053	0.056	-6.8%
	Al Qadisiyah	0.043	0.085	0.078	0.077	0.080	0.080	0.080	0.075	7.3%
	Karbala	0.002	0.001	0.002	0.002	0.003	0.003	0.002	0.002	-6.1%
	Al Anbar	0.002	0.003	0.003	0.002	0.003	0.003	0.003	0.003	2.4%
	An Najaf	0.001	0.001	0.002	0.002	0.002	0.002	0.001	0.002	-8.3%
	Al Muthanna	0.023	0.033	0.038	0.023	0.027	0.025	0.028	0.028	-0.9%
South	Dhi Qar	0.043	0.043	0.064	0.082	0.075	0.075	0.059	0.063	-6.4%
	Maysan	0.030	0.038	0.066	0.071	0.065	0.065	0.060	0.056	6.6%
	Al Basrah	0.009	0.007	0.006	0.005	0.006	0.005	0.007	0.006	4.1%
	Total	1.20	1.23	1.12	1.50	1.42	1.45	0.50	1.20	-58.2%

Whe	at Area Fo									
Region	Governorate	2002/03	2003/04	2004/05	2005/06	2006/07	2007/08	2008/09	5-Year Average	Difference 5-Year Avg
North	Arbil	0.133	0.235	0.099	0.117	0.127	0.120	0.017	0.121	-85.6%
	Dahuk	0.122	0.129	0.098	0.102	0.091	0.100	0.026	0.095	-72.3%
	As Sulaymaniyah	0.163	0.109	0.070	0.153	0.120	0.120	0.070	0.115	-39.2%
	Ninawa	0.751	0.450	0.613	0.551	0.489	0.464	0.027	0.478	-94.3%
Central	At Ta'min	0.179	0.183	0.160	0.195	0.141	0.205	0.104	0.167	-37.9%
	Diyala	0.063	0.094	0.087	0.109	0.113	0.106	0.079	0.093	-15.0%
	Salah ad Din	0.110	0.125	0.107	0.110	0.108	0.107	0.094	0.109	-13.5%
	Baghdad	0.043	0.055	0.043	0.060	0.059	0.048	0.053	0.052	2.9%
	Babil	0.047	0.083	0.049	0.068	0.068	0.065	0.064	0.064	1.4%
	Wasit	0.165	0.159	0.148	0.166	0.157	0.164	0.148	0.158	-6.4%
	Al Qadisiyah	0.058	0.065	0.093	0.094	0.095	0.092	0.090	0.084	7.7%
	Karbala	0.006	0.005	0.006	0.007	0.004	0.002	0.004	0.005	-10.0%
	Al Anbar	0.036	0.033	0.043	0.035	0.056	0.057	0.044	0.043	1.1%
	An Najaf	0.046	0.045	0.046	0.048	0.045	0.050	0.043	0.046	-7.6%
	Al Muthanna	0.006	0.017	0.018	0.012	0.012	0.011	0.012	0.013	-3.4%
South	Dhi Qar	0.020	0.020	0.032	0.046	0.061	0.059	0.035	0.039	-11.2%
	Maysan	0.055	0.063	0.077	0.088	0.087	0.094	0.086	0.079	9.1%
	Al Basrah	0.013	0.016	0.016	0.014	0.017	0.017	0.016	0.016	4.6%
	Total	2.02	1.89	1.81	1.97	1.85	1.88	1.01	1.78	-42.9%

5-Year Average



Barle	y Area Fo	recast	: MY 20	008/09	(Million Hectares)					
Region	Governorate	2002/03	2003/04	2004/05	2005/06	2006/07	2007/08	2008/09	5-Year Average	Difference 5-Year Avg
North	Arbil	0.110	0.149	0.086	0.271	0.243	0.250	0.022	0.161	-86.5%
	Dahuk	0.032	0.039	0.027	0.037	0.041	0.050	0.009	0.034	-72.2%
	As Sulaymaniyah	0.122	0.043	0.052	0.125	0.108	0.110	0.051	0.087	-41.2%
	Ninawa	0.653	0.525	0.529	0.614	0.595	0.615	0.029	0.509	-94.2%
Central	At Ta'min	0.025	0.038	0.010	0.023	0.029	0.030	0.015	0.024	-38.4%
	Diyala	0.023	0.095	0.038	0.037	0.035	0.035	0.034	0.042	-19.5%
	Salah ad Din	0.016	0.030	0.039	0.028	0.015	0.015	0.020	0.023	-15.6%
	Baghdad	0.005	0.033	0.005	0.008	0.006	0.005	0.009	0.010	-9.1%
	Babil	0.012	0.017	0.021	0.020	0.024	0.025	0.020	0.020	2.1%
	Wasit	0.048	0.047	0.055	0.069	0.063	0.060	0.053	0.056	-6.8%
	Al Qadisiyah	0.043	0.085	0.078	0.077	0.080	0.080	0.080	0.075	7.3%
	Karbala	0.002	0.001	0.002	0.002	0.003	0.003	0.002	0.002	-6.1%
	Al Anbar	0.002	0.003	0.003	0.002	0.003	0.003	0.003	0.003	2.4%
	An Najaf	0.001	0.001	0.002	0.002	0.002	0.002	0.001	0.002	-8.3%
	Al Muthanna	0.023	0.033	0.038	0.023	0.027	0.025	0.028	0.028	-0.9%
South	Dhi Qar	0.043	0.043	0.064	0.082	0.075	0.075	0.059	0.063	-6.4%
	Maysan	0.030	0.038	0.066	0.071	0.065	0.065	0.060	0.056	6.6%
	Al Basrah	0.009	0.007	0.006	0.005	0.006	0.005	0.007	0.006	4.1%
	Total	1.20	1.23	1.12	1.50	1.42	1.45	0.50	1.20	-58.2%

Whe	Wheat Area Forecast: MY 2008/09 (Million Hectares)										
Region	Governorate	2002/03	2003/04	2004/05	2005/06	2006/07	2007/08	2008/09	5-Year Average	Difference 5-Year Avg	
North	Arbil	0.133	0.235	0.099	0.117	0.127	0.120	0.017	0.121	-85.6%	
	Dahuk	0.122	0.129	0.098	0.102	0.091	0.100	0.026	0.095	-72.3%	
	As Sulaymaniyah	0.163	0.109	0.070	0.153	0.120	0.120	0.070	0.115	-39.2%	
	Ninawa	0.751	0.450	0.613	0.551	0.489	0.464	0.027	0.478	-94.3%	
Central	At Ta'min	0.179	0.183	0.160	0.195	0.141	0.205	0.104	0.167	-37.9%	
	Diyala	0.063	0.094	0.087	0.109	0.113	0.106	0.079	0.093	-15.0%	
	Salah ad Din	0.110	0.125	0.107	0.110	0.108	0.107	0.094	0.109	-13.5%	
	Baghdad	0.043	0.055	0.043	0.060	0.059	0.048	0.053	0.052	2.9%	
	Babil	0.047	0.083	0.049	0.068	0.068	0.065	0.064	0.064	1.4%	
	Wasit	0.165	0.159	0.148	0.166	0.157	0.164	0.148	0.158	-6.4%	
	Al Qadisiyah	0.058	0.065	0.093	0.094	0.095	0.092	0.090	0.084	7.7%	
	Karbala	0.006	0.005	0.006	0.007	0.004	0.002	0.004	0.005	-10.0%	
	Al Anbar	0.036	0.033	0.043	0.035	0.056	0.057	0.044	0.043	1.1%	
	An Najaf	0.046	0.045	0.046	0.048	0.045	0.050	0.043	0.046	-7.6%	
	Al Muthanna	0.006	0.017	0.018	0.012	0.012	0.011	0.012	0.013	-3.4%	
South	Dhi Qar	0.020	0.020	0.032	0.046	0.061	0.059	0.035	0.039	-11.2%	
	Maysan	0.055	0.063	0.077	0.088	0.087	0.094	0.086	0.079	9.1%	
	Al Basrah	0.013	0.016	0.016	0.014	0.017	0.017	0.016	0.016	4.6%	
	Total	2.02	1.89	1.81	1.97	1.85	1.88	1.01	1.78	-42.9%	

THANK YOU! CONTACT INFORMATION AND QUESTIONS AND ANSWERS

Iraq Operational Agricultural Monitoring Project:

United States Department of Agriculture (USDA)
Foreign Agricultural Service (FAS)
Office of Global Analysis (OGA)
International Production Assessment (IPA) Division





Presenter:

J. Edward Kunz, GISP

Geospatial Program Manager ASRC Management Services ed.kunz@asrcms.com

Sean Griffin

Remote Sensing Crop Analyst Supporting USDA/FAS/OGA/IPA sean.griffin@asrcms.com



Photo by Dr. Curt Reynolds